

# Aggregate Cache



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## Aggregates in Enterprise Applications

- Current handling
  - Application-maintained sum tables in OLTP systems
  - Materialized views in OLAP systems
- Problems
  - Increased application complexity
  - Reduced throughput of insert statements
  - Reporting on stale and redundant data
  - Inflexible analytics due to predefined materialized views
- Goal: highest flexibility by operating on the highest granularity
  - Remove predefined materialized aggregates and sum tables
  - Execution of both transactional AND analytical queries on a single system
  - Reduction of application complexity
  - Flexible, real-time analytics
- Outlook on future enterprise application workloads:  
increasingly **higher share of aggregate queries**

# The Aggregate Cache

- Idea: **cache** the aggregate query result on **main partition** and **combine** it with an **on-the-fly** aggregation on **delta partition**
  - Supporting distributive or algebraic aggregate functions (SUM, COUNT, AVG, MIN, MAX)
  - One aggregate cache entry per unique combination of table id, grouping attributes, aggregates, and filter predicates
- Materialized aggregate maintenance is delayed (or skipped) until delta merge process
  - Cached aggregate “inconsistency” caused by **inserts** is compensated by on-the-fly aggregation on delta partition
  - Cached aggregate “inconsistency” caused by **updates and deletes** (invalidations in main partition) is compensated by revalidation using bit vectors on main partition & on-the-fly aggregation on delta partition

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## Example: Aggregate Query

| Facts |          |      |     |       |      |      |     |
|-------|----------|------|-----|-------|------|------|-----|
| Main  |          |      |     | Delta |      |      |     |
| ID    | Date     | Prod | Amt | ID    | Date | Prod | Amt |
| 1     | 1/1/2013 | 1    | 100 |       |      |      |     |
| 2     | 1/1/2013 | 1    | -50 |       |      |      |     |
| 3     | 1/1/2013 | 2    | 30  |       |      |      |     |
| 4     | 1/1/2013 | 2    | 60  |       |      |      |     |
| 5     | 1/2/2013 | 1    | -10 |       |      |      |     |



SELECT Date, Prod, SUM(Amt) FROM Facts GROUP BY Date , Prod



| Aggregates |      |          |
|------------|------|----------|
| Date       | Prod | SUM(Amt) |
| 1/1/2013   | 1    | 50       |
| 1/2/2013   | 1    | -10      |
| 1/1/2013   | 2    | 90       |

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# Example: Cached Aggregate Query

| Facts |          |      |     |       |          |      |     |
|-------|----------|------|-----|-------|----------|------|-----|
| Main  |          |      |     | Delta |          |      |     |
| ID    | Date     | Prod | Amt | ID    | Date     | Prod | Amt |
| 1     | 1/1/2013 | 1    | 100 |       |          |      |     |
| 2     | 1/1/2013 | 1    | -50 |       |          |      |     |
| 3     | 1/1/2013 | 2    | 30  |       |          |      |     |
| 4     | 1/1/2013 | 2    | 60  |       |          |      |     |
| 5     | 1/2/2013 | 1    | -10 |       |          |      |     |
|       |          |      |     | 6     | 1/2/2013 | 1    | 20  |
|       |          |      |     | 7     | 1/1/2013 | 3    | 50  |
|       |          |      |     | 8     | 1/1/2013 | 3    | -10 |

SELECT Date, Prod, SUM(Amt) FROM Facts GROUP BY Date , Prod

| Aggregates |      |          |
|------------|------|----------|
| Date       | Prod | SUM(Amt) |
| 1/1/2013   | 1    | 50       |
| 1/2/2013   | 1    | -10      |
| 1/1/2013   | 2    | 90       |

Main (cached)

Delta (on-the-fly)

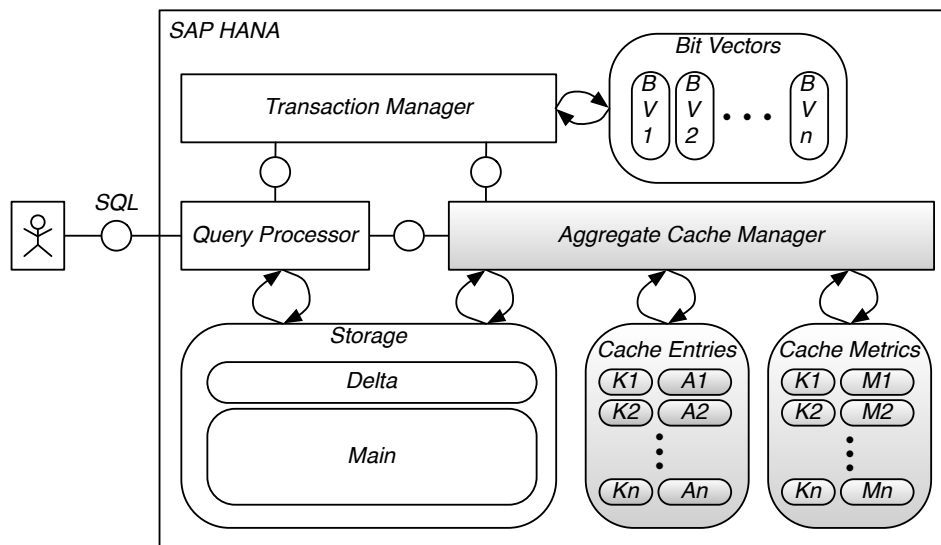
| Aggregates |      |          |
|------------|------|----------|
| Date       | Prod | SUM(Amt) |
| 1/2/2013   | 1    | 20       |
| 1/1/2013   | 3    | 40       |

SELECT Date, Prod, SUM(Amt)  
FROM (Select \* FROM CachedAggl234 UNION ALL Select \* FROM Facts\_Delta) GROUP BY  
Date , Prod

| Aggregates |      |          |
|------------|------|----------|
| Date       | Prod | SUM(Amt) |
| 1/1/2013   | 1    | 50       |
| 1/2/2013   | 1    | 10       |
| 1/1/2013   | 2    | 90       |
| 1/1/2013   | 3    | 40       |

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## The Aggregate Cache



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# Cache Admission and Eviction Strategies

- Goal
  - Limit cache growth and storage requirements
  - Reduce cache overhead and maintenance
- Cost-based approaches
  - Tuple counts
  - Execution times
  - Result set sizes
  - Main invalidations
- Two stages
  - Cache admission and replacement during query execution
  - Benefit analysis during cache maintenance (merge process)
- Results: performance improvements of ~40% over LRU and ~15% over existing cost-based metrics (Watchman/Dynamat)

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# Deletes and Updates

- Record validity is handled through create and delete bit vectors
  - Delete: set delete bit vector
  - Update: set delete bit vector & insert new value in delta
- Efficient retrieval of invalidated records through bit vectors
- Applying invalidations to the cache entry ensures a consistent result

| \$row_id\$ | Create Baselist | Delete Baselist | Create Chunks | Delete Chunks |
|------------|-----------------|-----------------|---------------|---------------|
| 1          | 1               | 0               | empty chunk   | empty chunk   |
| 2          | 1               | 0               |               |               |
| 3          | 1               | 0               |               |               |
| 4          | 1               | 1               |               |               |
| 5          | 1               | 0               | empty chunk   | T1            |
| 6          | 1               | 0               |               | T2            |
| 7          | 1               | 0               |               | 0             |
| 8          | 1               | 0               |               | 0             |
| 9          | 1               | 0               | 0             | empty chunk   |
| 10         | 1               | 0               |               |               |
| 11         | 0               | 0               |               |               |
| 12         | 1               | 0               |               |               |

1. 

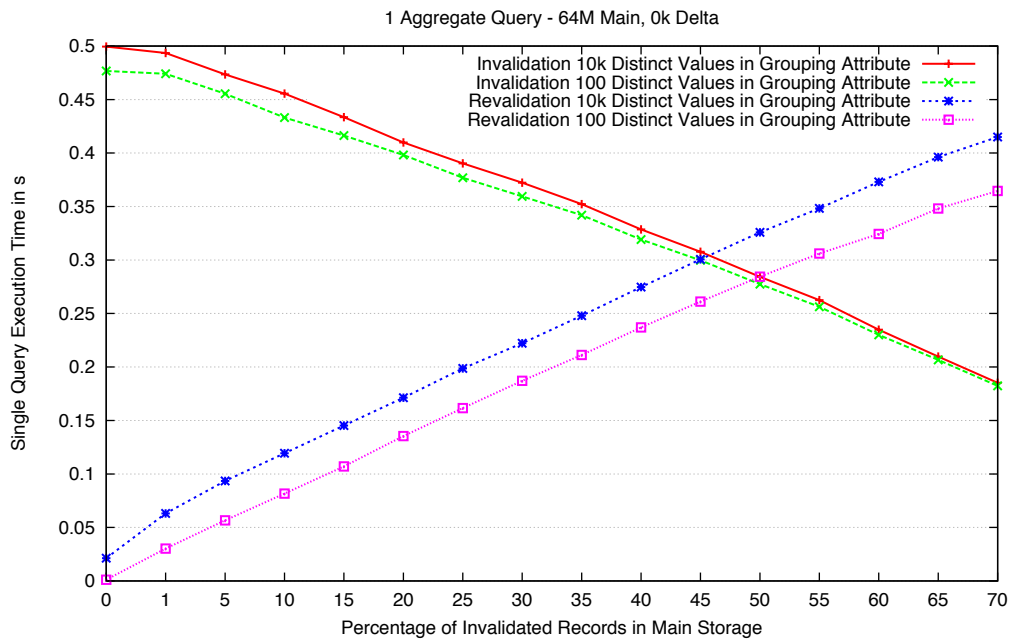
|     |                                 |
|-----|---------------------------------|
|     | 11111111101 (create bit vector) |
| XOR | 00010000000 (delete bit vector) |
| =   | 11101111101                     |
2. 

|     |                            |
|-----|----------------------------|
|     | 11101111101                |
| ADD | 00000000010 (create chunk) |
| =   | 11101111111                |
3. 

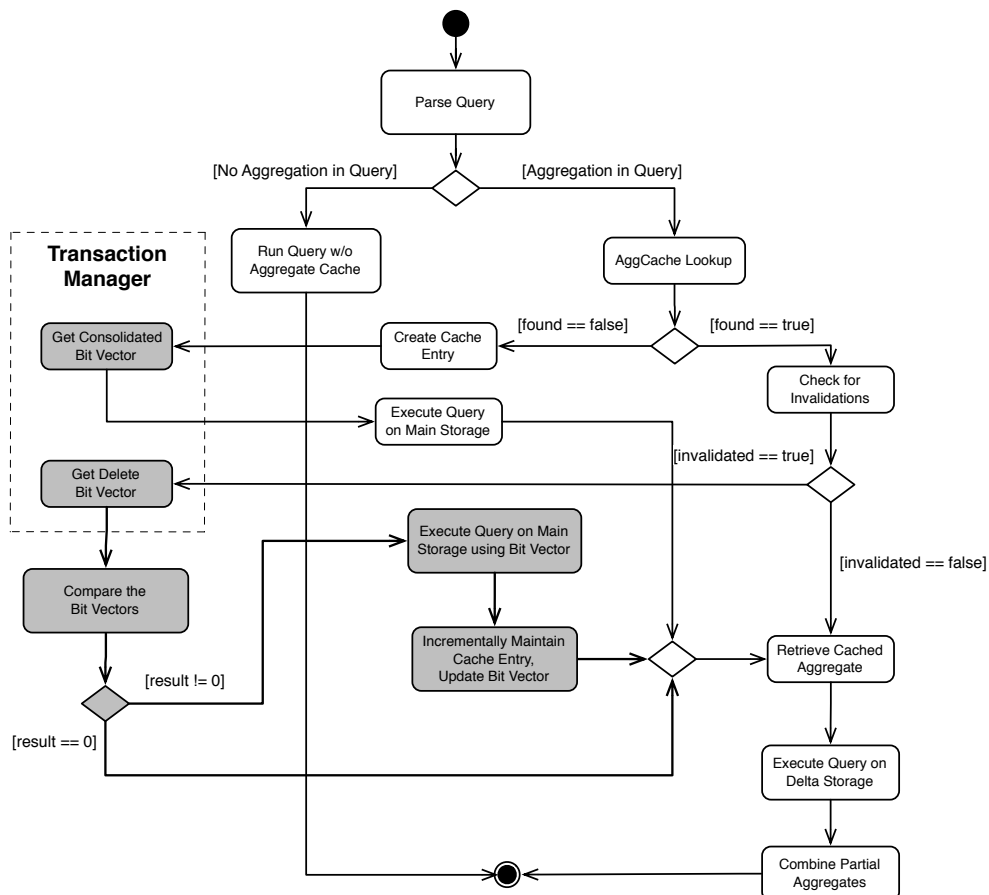
|     |                            |
|-----|----------------------------|
|     | 11101111111                |
| SUB | 00000100000 (delete chunk) |
| =   | 11101011111                |
4. **11101011111**

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# Invalidation Ratio

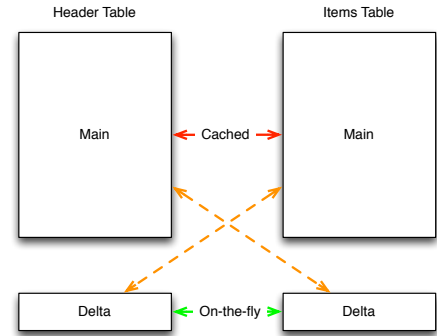


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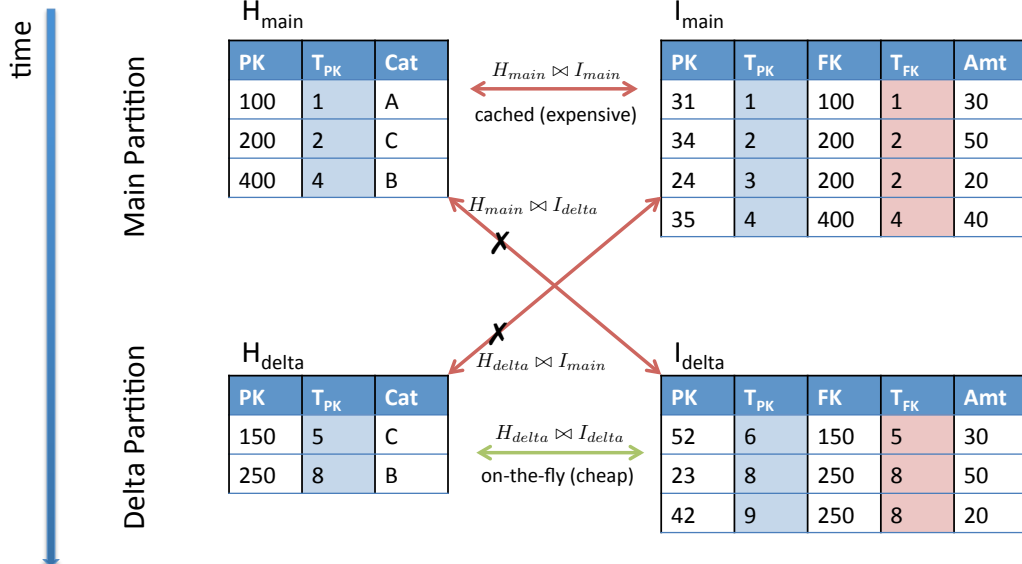


# Aggregates on Multiple Relations

- Increased materialized aggregate maintenance for queries joining multiple (partitioned) tables
- The number of join operations depends on the number of involved tables
- Patterns found in enterprise applications
  - Text and configuration tables are rarely changed (empty deltas)
  - Header and items tuples are created and inserted in a **single transaction**
  - In some cases (adding items to a sales order), items can be added to the header after initial creation
- Idea: add temporal relation to matching tuples during insertion and execute join pruning based on this “**object awareness**” information



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Enforce matching dependency during inserts:

$$\forall i \in I, i[FK] = h[PK] : i[T_{FK}] = h[T_{PK}]$$

Dynamic join pruning during query execution:

$$\max(H_{main}[T_{PK}]) < \min(I_{delta}[T_{FK}]) \longrightarrow H_{main} \bowtie_{H[PK]=I[FK]} I_{delta} = \emptyset \quad \checkmark \quad 4 < 5$$

$$\max(I_{main}[T_{FK}]) < \min(H_{delta}[T_{PK}]) \longrightarrow I_{main} \bowtie_{H[PK]=I[FK]} H_{delta} = \emptyset \quad \checkmark \quad 4 < 5$$

time

Main Partition

$H_{main}$

| PK  | $T_{PK}$ | Cat |
|-----|----------|-----|
| 100 | 1        | A   |
| 200 | 2        | C   |
| 400 | 4        | B   |

$H_{main} \bowtie I_{main}$   
cached (expensive)

$I_{main}$

| PK | $T_{PK}$ | FK  | $T_{FK}$ | Amt |
|----|----------|-----|----------|-----|
| 31 | 1        | 100 | 1        | 30  |
| 34 | 2        | 200 | 2        | 50  |
| 24 | 3        | 200 | 2        | 20  |
| 35 | 4        | 400 | 4        | 40  |
| 52 | 6        | 150 | 5        | 30  |

$H_{main} \bowtie I_{delta}$

✗

Delta Partition

$H_{delta}$

| PK  | $T_{PK}$ | Cat |
|-----|----------|-----|
| 150 | 5        | C   |
| 250 | 8        | B   |

$H_{delta} \bowtie I_{main}$

$I_{delta}$

| PK | $T_{PK}$ | FK  | $T_{FK}$ | Amt |
|----|----------|-----|----------|-----|
| 23 | 8        | 250 | 8        | 50  |
| 42 | 9        | 250 | 8        | 20  |

$H_{delta} \bowtie I_{delta}$   
on-the-fly (cheap)

Enforce matching dependency during inserts:

$$\forall i \in I, i[FK] = h[PK] : i[T_{FK}] = h[T_{PK}]$$

Dynamic join pruning during query execution:

$$\max(H_{main}[T_{PK}]) < \min(I_{delta}[T_{FK}]) \rightarrow H_{main} \bowtie_{H[PK]=I[FK]} I_{delta} = \emptyset \quad \checkmark \quad 4 < 8$$

$$\max(I_{main}[T_{FK}]) < \min(H_{delta}[T_{PK}]) \rightarrow I_{main} \bowtie_{H[PK]=I[FK]} H_{delta} = \emptyset \quad \times \quad 5 < 5$$